



Rule-Based Runtime Verification



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Overview

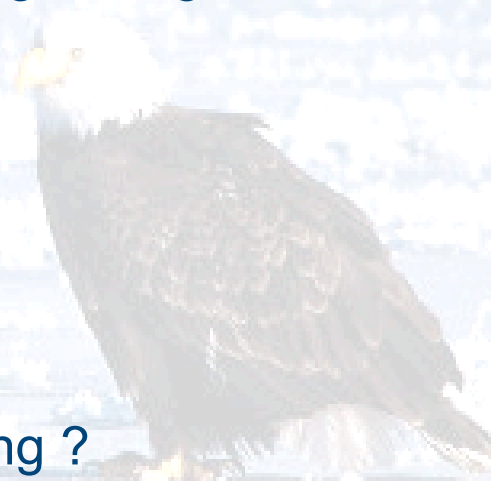
- Run-time Monitoring
- About EAGLE
- Enhanced Formal Testing
- Summary





Motivation

- Model checking and Theorem Proving are rigorous
 - Not scalable
 - Complex
- Testing is scalable and widely used
 - Ad hoc
 - Lack of coverage
- Combine Formal Methods and Testing ?
 - Gain the benefits of both the approaches.
 - Avoid the pitfalls of ad hoc testing.
 - Avoid the complexity of theorem proving and model checking.



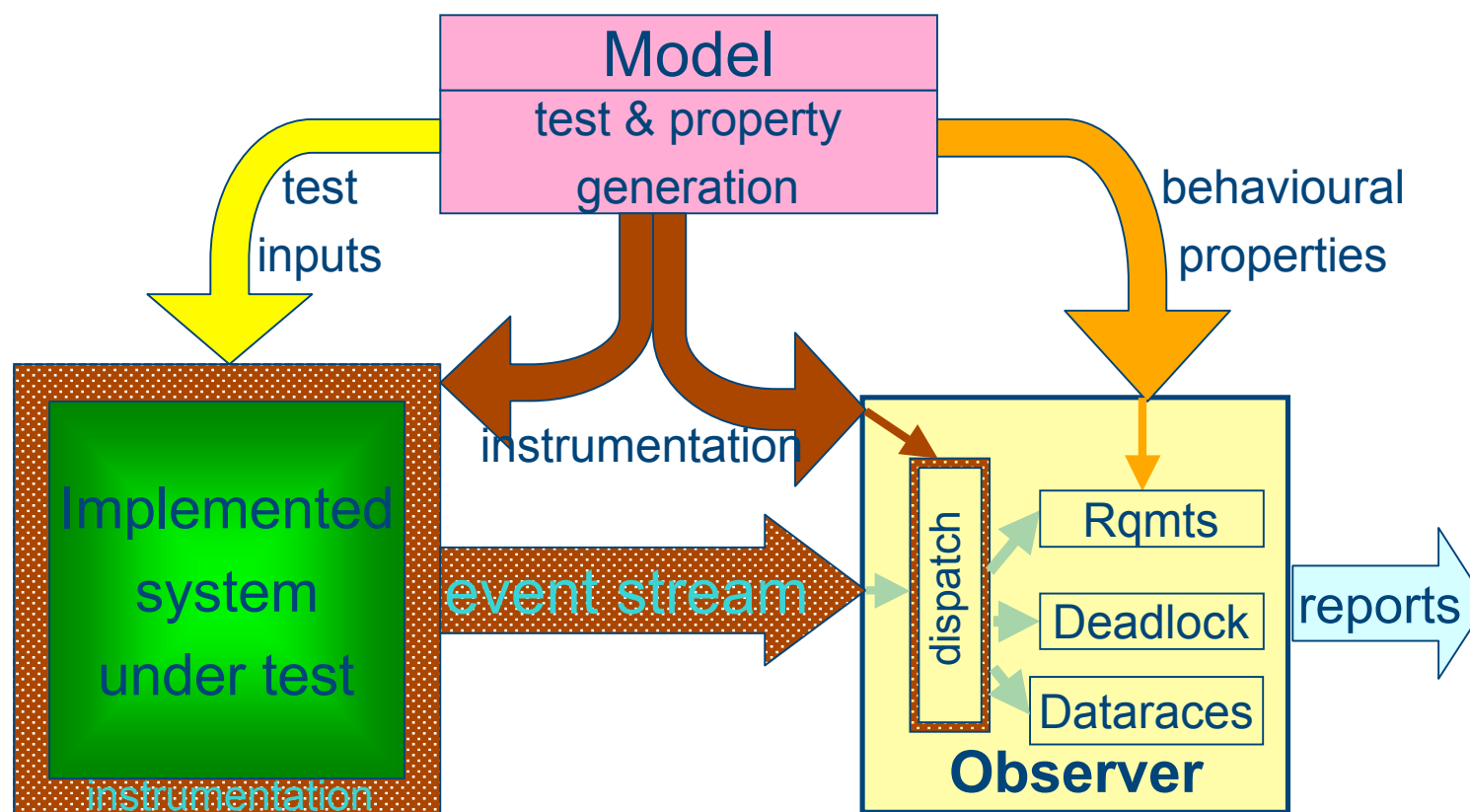


Run-time Verification

- Merge testing and temporal logic specification
 - Specify safety properties in some temporal logic.
 - Instrument program to generate events.
 - Monitor safety properties against a trace of event emitted by the running program.
- Pros: Scalable
- Cons: Lack of Coverage



A Model-Based Verification Architecture





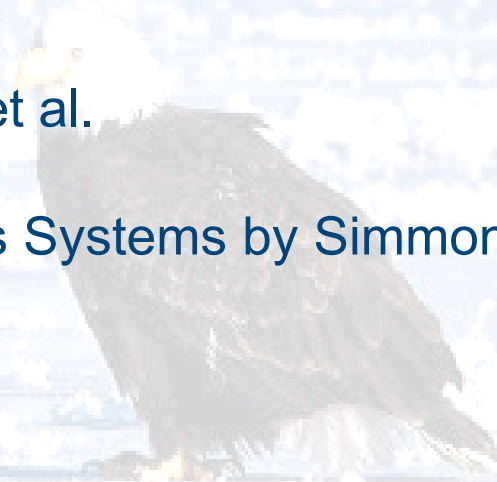
Our work on Rqmts Monitoring

- Future time propositional:
 - Backwards dynamic programming algorithm
 - Forward rewriting algorithm (in Maude)
 - “Buchi” automata generation (Giannakopoulou)
 - BTT automata generation
- Past time propositional:
 - Forwards dynamic programming algorithm



Other Work on Rqmts Monitoring

- MaC Tool (UPenn) – uses past-time interval logic
- Temporal Rover – commercial tool
- Statistics Collection by Finkbeiner et al.
- Debugging Distributed Autonomous Systems by Simmons et al. (CMU)
- ...





So many logics ...

- What is the most basic, yet, general specification language suitable for monitoring?



EAGLE is our answer.

Based on recursive rules over next, previous and concatenation “temporal” connectives.

Can encode future time temporal logic, past-time logic, ERE, μ -calculus, real-time, data-binding, statistics....



Introducing EAGLE

- Rule-based **finite trace** monitoring logic
- User defines
 - a set of temporal rules
 - a set of monitoring formulas
- Monitors evaluated over a given input trace, on a state by state basis
- Evaluation proceeds by checking facts and generating obligations



Syntax

$S ::= \text{dec } D \text{ obs } O$

$D ::= R^*$

$O ::= M^*$

$R ::= \{ \mathbf{max} \mid \mathbf{min} \} N(T_1 x_1, \dots, T_n x_n) = F$

$M ::= N = F$

$T ::= \mathbf{Form} \mid \text{java primitive type}$

$F ::= \text{java expression} \mid \mathbf{True} \mid \mathbf{False} \mid \neg F \mid F_1 \wedge F_2 \mid F_1 \vee F_2 \mid F_1 \rightarrow F_2 \mid$
 $\bigcirc F \mid \odot F \mid F_1 \cdot F_2 \mid N(F_1, \dots, F_n)$



Semantics

$\sigma, l \models_D \text{exp}$	iff $1 \leq l \leq \sigma $ and $\text{evaluate}(\text{exp})(\sigma(l)) == \text{true}$
$\sigma, l \models_D \underline{\text{true}}$	
$\sigma, l \not\models_D \underline{\text{false}}$	
$\sigma, l \models_D \neg F$	iff $\sigma, l \not\models_D F$
$\sigma, l \models_D F_1 \wedge F_2$	iff $\sigma, l \models_D F_1$ and $\sigma, l \models_D F_2$
$\sigma, l \models_D F_1 \vee F_2$	iff $\sigma, l \models_D F_1$ or $\sigma, l \models_D F_2$
$\sigma, l \models_D F_1 \rightarrow F_2$	iff $\sigma, l \models_D F_1$ implies $\sigma, l \models_D F_2$
$\sigma, l \models_D \bigcirc F$	iff $l \leq \sigma $ and $\sigma, l+1 \models_D F$
$\sigma, l \models_D \odot F$	iff $1 \leq l$ and $\sigma, l-1 \models_D F$
$\sigma, l \models_D F_1 \cdot F_2$	iff $\exists j$ s.t. $l \leq j \leq \sigma + 1$ and $\sigma^{[1, j-1]}, l \models_D F_1$ and $\sigma^{[j, \sigma]}, 1 \models_D F_2$
$\sigma, l \models_D N(F_1, \dots, F_m)$	iff $\begin{cases} \text{if } 1 \leq l \leq \sigma \text{ then:} \\ \quad \sigma, l \models_D F[x_1 \mapsto F_1, \dots, x_{\text{or}} \mapsto F_m] \\ \quad \text{where } (N(T_1 x_1, \dots, T_{\text{or}} x_{\text{or}}) = F) \in D \\ \text{otherwise, if } l = 0 \text{ or } l = \sigma + 1 \text{ then:} \\ \quad \text{rule } N \text{ is defined as } \underline{\text{max}} \text{ in } D \end{cases}$



EAGLE by example: LTL

max Always(Form F) = F \wedge _ Always(F) .

min Eventually(Form F) = F \vee _ Eventually(F) .

max EventuallyP(Form F) = F \vee _ EventuallyP(F) .

To monitor the LTL formula _(x>0 _ _ y=3), write

mon M1 = Always(x > 0 -> EventuallyP(y=3)) .



EAGLE by example: data binding

$$_ (x > 0 \rightarrow _k. k = x /\wedge _ y = 3)$$

can be written as

mon M1 = Always($x > 0 \rightarrow \underline{\text{let } k = x \text{ in } \underline{\text{Eventually}}(y = k)}$).

which is rewritten using a data parameterized rule:

min $R(\underline{\text{int } k}) = \underline{\text{Eventually}}(y = k)$.

mon M2 = Always($x > 0 \rightarrow R(x)$) .



EAGLE by example: metric LTL

Timed operators, such as: $_ [t1, t2]$

assume events are time-stamped $_$ state variable
clock

min TEventuallyAbs(Form F, float t1, float t2)
= clock \leq t2 \wedge
 (F \rightarrow t1 \leq clock) \wedge
 (\sim F \rightarrow $_$ TEventuallyAbs(F, t1, t2)) .

min TEventually(Form F, float t1, float t2)
= TEventuallyAbs(F, t1+clock, t2+clock) .



EAGLE by example: statistical logics

Monitor that state property **F** holds with at least probability **p** over the given sequence

$$\begin{aligned} \min A(\text{Form } F, \text{float } p, \text{int } f, \text{int } t) = & \\ & (_Empty() \wedge ((F \wedge (1 - f/t) \geq p) \vee \\ & \quad (\neg F \wedge (1 - (f+1)/t) \geq p))) \\ & \vee \\ & (\neg Empty() \wedge ((F \rightarrow _A(F, p, f, t+1)) \wedge (\neg F \rightarrow _A(F, p, f+1, \\ & \quad t+1)))). \end{aligned}$$
$$\min \text{AtLeast } (\text{Form } F, \text{float } p) = A(F, p, 0, 1) .$$

EAGLE by example: beyond regular languages



Monitor a sequence of login and logout events – at no point should there be more logouts than logins and they should match by the end.

min Match (Form F1, Form F2) =
Empty() \vee
F1 • Match(F1, F2) • F2 • Match(F1, F2)

mon M1 = Match(login, logout)



Some EAGLE facts

- EAGLE-LTL (past and future). Monitoring formula of size m has space complexity bounded by $m^2 2^m \log m$
- EAGLE with data binding has worst case dependent on length of input trace
- EAGLE without data is at least Context Free
- EAGLE logic currently implemented by rewriting as a Java application



EAGLE: Internal Calculus

Uses **four** functions

init: Form X Form X Form -> Form

transforms a monitor formula (1st arg) for evaluation, in particular the primitive _ and _ are replaced by rules Next and Previous with history parameters introduced to past-time rules

eval: Form X State -> Form

applies the given state to the formula yielding the obligation for the future

update: Form X State X Form X Form -> Form

updates the past time components in the formula (1st arg)

value: Form -> Bool

yields the value of the given formula at the end of monitoring



EAGLE: Internal Calculus – eval - I

$\text{eval}\langle\langle \text{true}, s \rangle\rangle = \text{true}$

$\text{eval}\langle\langle \text{false}, s \rangle\rangle = \text{false}$

$\text{eval}\langle\langle \text{exp}, s \rangle\rangle = \text{value of exp in state } s$

$\text{eval}\langle\langle F_1 \text{ op } F_2, s \rangle\rangle = \text{eval}\langle\langle F_1, s \rangle\rangle \text{ op } \text{eval}\langle\langle F_2, s \rangle\rangle$

$\text{eval}\langle\langle \neg F, s \rangle\rangle = \neg \text{eval}\langle\langle F, s \rangle\rangle$

$\text{eval}\langle\langle F_1 _ F_2, s \rangle\rangle = \text{if } \neg \text{value}\langle\langle F_1 \rangle\rangle \text{ then } \text{eval}\langle\langle F_1, s \rangle\rangle _ F_2$
 $\text{else } (\text{eval}\langle\langle F_1, s \rangle\rangle _ F_2) \vee \text{eval}\langle\langle F_2, s \rangle\rangle$



EAGLE: Internal Calculus – eval - II

$\text{eval}\langle\langle \text{Next}(F), s \rangle\rangle = \text{update} \langle\langle F, s, \text{null}, \text{null} \rangle\rangle$

Evaluation of a next time formula $\text{Next}(F)$ yields the obligation to evaluate F in the next state. Note that any past time args are updated by application of update

$\text{eval}\langle\langle \text{Previous}(F, \text{past}), s \rangle\rangle = \text{eval}\langle\langle \text{past}, s \rangle\rangle$

Since past is the (possibly partial) evaluation of F from the previous state, the evaluation of a previous time formula must just re-evaluate past in the current state

The cases of eval for rule definitions are synthesised from the rules



EAGLE: Internal Calculus – eval - III

Given rule: $\{\mathbf{max|min}\} R(\mathbf{Form} \ f, \ \underline{\mathbf{I}} \ p) = B$

a call: $R(F, P)$

is transformed to: $\underline{R}(\underline{b}.H(b), P)$

where H is the transformed version of B with formal formula parameters f replaced by the transformed actual formulas F , the actual data parameters P appear as argument to \underline{R} and any recursive calls to R with the same actual formula arguments are replaced by the recursion variable b

E.g.

$\mathbf{Always}(\mathbf{Eventually}(x>0))$

is transformed to:

$\underline{\mathbf{Always}}(\underline{b}_1. \ \underline{\mathbf{Eventually}}(\underline{b}_2. (x>0) \vee \underline{\mathbf{Next}}(b_2))) \wedge \underline{\mathbf{Next}}(b_1))$

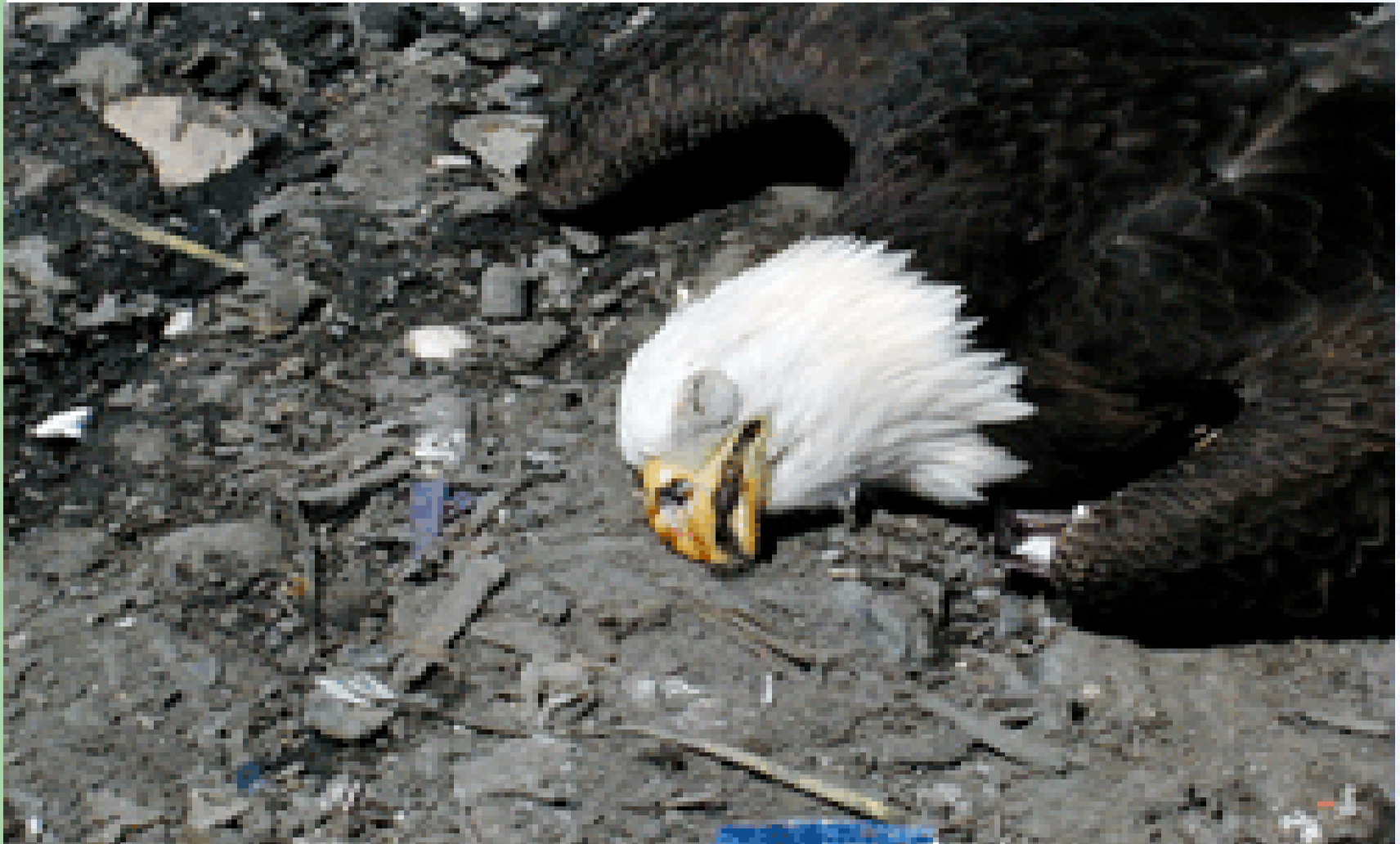
Then the evaluation is synthesised according to:

$\mathbf{eval}\langle \underline{R}(\underline{b}.H(b), P), s \rangle = \mathbf{eval}\langle H(\underline{b}.H(b))[p \ _ \ \mathbf{eval}\langle P, s \rangle], s \rangle$

the recursion is unfolded once, formal data parameters are substituted by the evaluated actuals, and then the whole re-evaluated.



EAGLE: Internal Calculus – eval - III





Example Execution

$_ (x > 0 _ _ x = 0)$

Specification:

$\max A(\text{Term } f) = f \wedge @ A(f) .$

$\min E(\text{Term } f) = f \vee @ E(f) .$

$\text{monitor } M = A(\{x\} > \{0\} _ E(\{x\} == \{0\})).$

Trace:

$x=1$

$x=2$

$x=0$

$x=3$



Trace Evaluation

$_ (x > 0 \ _ _ x = 0)$

Formulas: $[A(((x > 0) \wedge E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec})))) \wedge \text{Next}(A(\text{rec})) ++ (x > 0) \wedge \text{Next}(A(\text{rec})) ++ \text{Next}(A(\text{rec}))))]$

state = {x=1}

$_ x = 0 \ _ (x > 0 \ _ _ x = 0)$

$E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec})))) \wedge A(((x > 0) \wedge E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec})))) \wedge \text{Next}(A(\text{rec})) ++ (x > 0) \wedge \text{Next}(A(\text{rec})) ++ \text{Next}(A(\text{rec}))))$

state = {x=2}

$_ x = 0 \ _ (x > 0 \ _ _ x = 0)$

$A(((x > 0) \wedge E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec})))) \wedge \text{Next}(A(\text{rec})) ++ (x > 0) \wedge \text{Next}(A(\text{rec})) ++ \text{Next}(A(\text{rec})))) \wedge E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec}))))$

state = {x=0}

$_ (x > 0 \ _ _ x = 0)$

$A(((x > 0) \wedge E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec})))) \wedge \text{Next}(A(\text{rec})) ++ (x > 0) \wedge \text{Next}(A(\text{rec})) ++ \text{Next}(A(\text{rec}))))$

state = {x=3}

$_ x = 0 \ _ (x > 0 \ _ _ x = 0)$

$E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec})))) \wedge A(((x > 0) \wedge E(((x == 0) ++ (x == 0) \wedge \text{Next}(E(\text{rec})) ++ \text{Next}(E(\text{rec})))) \wedge \text{Next}(A(\text{rec})) ++ (x > 0) \wedge \text{Next}(A(\text{rec})) ++ \text{Next}(A(\text{rec}))))$

Warning: Property M violated.



Correctness of EAGLE calculus

Theorem:

$$s_1, s_2, \dots, s_n, 1 \models_D F$$

iff

$\text{value}(\text{eval}(\dots \text{eval}(\text{eval}(\text{init}(F, \text{null}, \text{null}), s_1), s_2) \dots, s_n)) = \text{true}$

for all state sequences $s_1..s_n$ and formulas F



EAGLE: Implementation - I

- Initial implementation as a Java application
- Two phases:
 - System compiles the rule and monitor specification file to generate a set of Java classes, one for each rule and monitor
 - System then compiles the generated class files to Java bytecode and runs the monitoring engine on a given input trace

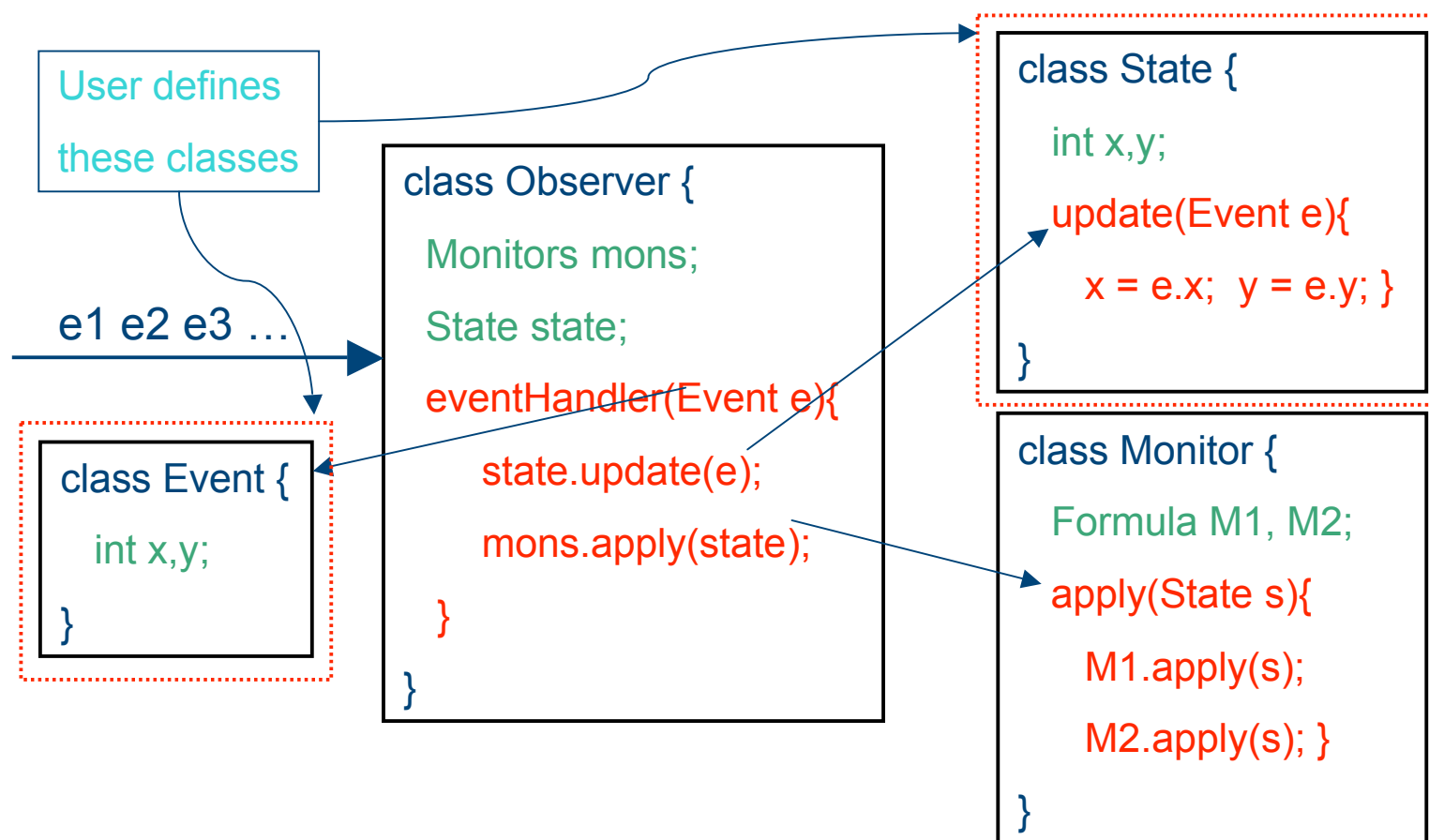


EAGLE: Implementation - II

- For efficiency, we use the propositional decision of Hsiang, where formulas are represented in Exclusive Or normal form, which is **exclusive or of conjuncts**.
- We use the following rewrite rules:
 - $F \wedge F = F$.
 - $\text{false} \wedge F = \text{false}$.
 - $\text{true} \wedge F = F$.
 - $\neg F = \text{true} _ F$.
 - $\text{false} _ F = F$.
 - $F1 \wedge (F2 _ F3) = (F1 \wedge F2) _ (F1 \wedge F3)$.
 - $F1 \vee F2 = (F1 \wedge F2) _ F1 _ F2$.



EAGLE interface





Summary

- **EAGLE** is a succinct but highly expressive finite trace monitoring logic
- **EAGLE** can be efficiently implemented, but users must remain aware of expensive features
- Demonstrated one use by integration within a formal test environment, showing the benefit of novel combinations of formal methods and test
- **EAGLE** can reach parts model checking can't
- **EAGLE** is almost an executable logic – can handle very limited form of action in current version



Future Work

- Optimisation of implementation – especially regarding partial evaluation
- Support user-defined surface syntax
- Associate actions with formulas – towards aspect oriented programming??
- Consider integration of **EAGLE** with algebraic specs
- Incorporate automated program instrumentation
- Fly **EAGLE** over **Rainbow**
- Consider Economic **EAGLE** – apply it to streams of economic data

EAGLE – Internal Calculus - update



$\text{update}\langle\text{true}, s, Z, b\rangle = \text{true}$
 $\text{update}\langle\text{false}, s, Z, b\rangle = \text{false}$

$\text{update}\langle\text{exp}, s, Z, b\rangle = \text{exp}$

$\text{update}\langle F_1 \text{ op } F_2, s, Z, b\rangle = \text{update}\langle F_1, s, Z, b\rangle \text{ op } \text{update}\langle F_2, s, Z, b\rangle$

$\text{update}\langle \neg F, s, Z, b\rangle = \neg \text{update}\langle F, s, Z, b\rangle$

$\text{update}\langle F_1 _ F_2, s, Z, b\rangle = \text{update}\langle F_1, s, Z, b\rangle _ F_2$

$\text{update}\langle \text{Next}(F), s, Z, b\rangle = \text{Next}(\text{update}\langle F, s, Z, b\rangle)$

$\text{update}\langle \text{Previous}(F, \text{past}), s, Z, b\rangle = \text{Previous}(\text{update}\langle F, s, Z, b\rangle, \text{eval}\langle F, s\rangle)$